## Reproducible computational environment, when?

How to redone later and over-there what had be done today and here?

#### Simon Tournier

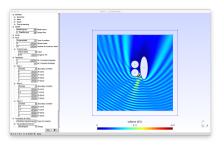
UMR 1342 - IRSL simon.tournier@inserm.fr @zimoun@sciences.re

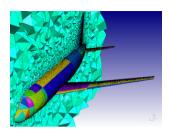
November 12th, 2025

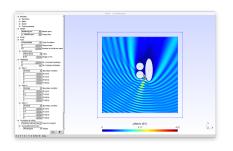


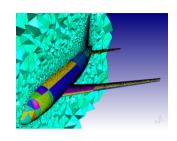


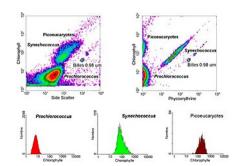


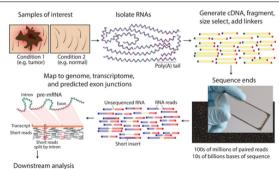


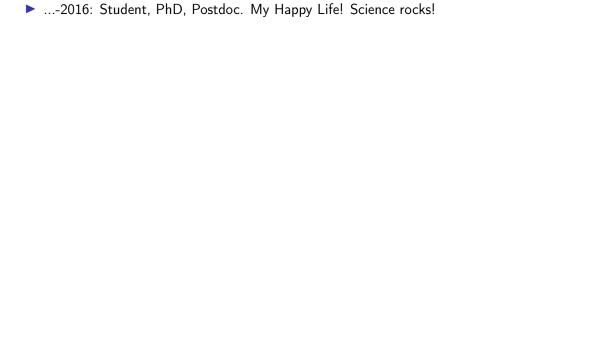












- ▶ ...-2016: Student, PhD, Postdoc. My Happy Life! Science rocks! ▶ 2016?: Attend Roberto Di Cosmo's talk (organized by ÉDF)

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# Bang! Collberg's 2015 reproducibility study (link)

NC HW 226

Article Web 226

Build bu

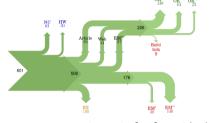
(even computer science is far from ideal!)

### 601 mainstream papers

- ► 508 with tools
- only 40% installable

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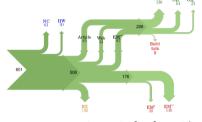
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# Bang! Collberg's 2015 reproducibility study (link)



601 mainstream papers

- 508 with tools
- only 40% installable

- (even computer science is far from ideal!)
- ▶ 2016-...: Start a permanent position in *biomedical* environment
  - Producing results implies many tools.
  - Spending too many resource fighting against these tools.
  - Science rocks...less!

Ok, that's an issue! why? what can we do?

#### Replication and reproducibility crisis

More than 70% of researchers have tried and **failed to reproduce** another scientist's experiments, and more than half have failed to reproduce their own experiments.

1,500 scientists lift the lid on reproducibility (Nature, 2016)  $_{(link)}$ 

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- Reprohackathons: promoting reproducibility in bioinformatics through training (link)

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```
Many causes... one solution? at least. Open Science helps
```

```
reproductibility = verification
replicability = validation
redo
```

Science = Transparent and Collective

Scientific result = Experiment + Numerical treatment

#### Science at the digital age:

Open Article HAL, BioArxiv

2. Open Data Data Repositories, Zenodo

3. Open Source Forges, GitLab

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. Computational env.

how to **glue** all that?

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how to glue all that?

today's topic considering long-term (1-5 years)

		audit		opaque		depend?
result	$\leftarrow$	paper	+	data	+	analysis
		protocol script		instruments data		materials environment

- ▶ audit is the « tractable » part
- opaque is generally the hard part

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...try to turn environment into audit

★ our issue

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...try to turn environment into audit

## Challenges about Reproducible Research

## From the « scientific method » viewpoint:

From the « scientific knowledge » viewpoint:

controlling the source of variations

 $\Rightarrow$  transparent as with instrument pprox computer

(universal?)

## ► Independant observer must be able to observe the same result.

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- ► The observation must be sustainable (to some extent).
- ⇒ collective

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  - The observation must be sustainable (to some extent).
- $\Rightarrow$  collective

In a world where (almost) all is data

how to redo later and elsewhere what has been done today and here?

(implicitely using a « computer »)

(universal?)

Agence Nationale de Sécurité du Médicament et des produits de santé (ANSM)

Logiciels et applications mobiles en santé (lien)

Certains de ces **logiciels sont des dispositifs médicaux** (DM) ou des dispositifs médicaux de diagnostic in vitro (DM DIV), car ils ont une finalité médicale.

Focus on « Santé » what I guess

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Software Bill of Materials (SBOM) and supply chain Guix blog post: Identifying software (link)

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 $\mathsf{software} = \mathsf{medical} \ \mathsf{device} \underset{\mathit{traceability}?}{\Longrightarrow} \mathsf{unique} \ \mathsf{identification}$ 

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#### Archive

Research software artifacts must be properly  $\frac{archived}{make}$  sure we can  $\frac{retrieve}{reproducibility}$ 

#### Reference

Research software artifacts must be properly referenced make sure we can identify them (reproducibility)

## Describe

Research software artifacts must be properly described make it easy to discover and reuse them (visibility)

## Cite/Credit

Research software artifacts must be properly cited (not the same as referenced!) to give credit to authors (evaluation!)

Situation

- 2 The problem of Alice and Blake
  - Capturing what?
  - How to capture?
- The Guix's way
- Source code archiving
  - Software Heritage
- Bridging?

(some examples from C programming language but all apply equally to any other computational stack)

Python, R, Julia, etc.

Capturing what?

## Software is dual

human-readable vs machine-readable

source + transformation → binary

Computational environment and source code archiving: difficulties and countermeasures

## Software is dual

#### human-readable vs machine-readable

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source + transformation → binary
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Program (source code)
/* Hello World program */
#include<stdio.h>
void main()
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## Program (excerpt of binary)

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4004e6: 55

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transparency?

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long-term? transparency

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long-term transparency

# Questions (1/2)

## Bessel function $J_0$ using C programming language

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#include <stdio.h>
#include <math.h>

int main(){
   printf("%E\n", j0f(0x1.33d152p+1f));
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# Questions (1/2)

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Alice sees: 5.643440E-08 Blake sees: 5.963430E-08

Why? In spite of everything being available (open)

Determine if the difference is significant or not is let to experts, scientific field by scientific field

Capturing what?

# Questions (2/2)

Alice and Blake both run « GCC at version 11.2.0 »

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still different\*

alice@laptop\$

5.643440E-08

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<sup>\*</sup> Not an issue with floating-point computations

# Questions (2/2)

Alice and Blake both run « GCC at version 11.2.0 »

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```
alice@laptop$ gcc bessel.c && ./a.out
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(due to constant folding\*\*)

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Alice and Blake are running two different computationnal environments

12 / 47

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(due to constant folding\*\*)

Alice and Blake are running two different computationnal environments

#### More than version number is required

- \* Not an issue with floating-point computations
- \*\* C language is an example, other source but similar issues with Python, R, Perl, etc.

The Guix's way

Situation

## Questions about a computational environment

- ▶ What is the code source?
- ▶ What are the tools required for building?
- What are the tools required for running?
- And recursively for each tool...

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Usually: package manager (Conda, APT, Brew, ...); Modulefiles; container; etc.  $\Rightarrow$  not enough!

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toward a solution: Guix

Situation

### Usual solutions and their difficulties

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apt-get update

How to inspect the base image?

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What if answering one question answers the other?

Situation

## Usual solutions and their difficulties

- package manager: Conda, pip, install.packages(), APT (Debian/Ubuntu), etc.
- 2 container : Docker, Singularity

$$Guix = #1 + #2$$

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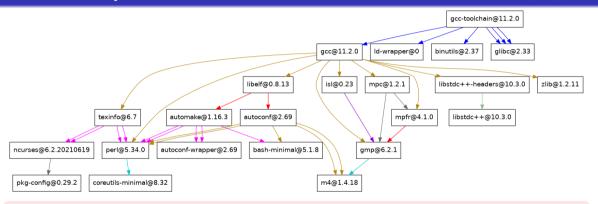
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What if answering one question answers the other?

Situation

## When Alice says « GCC at version 11.2.0 »

guix graph



Is it the same "version" of GCC if mpfr is replaced by version 4.0 ?

complete graph: 43 ou 104 ou 125 ou 218 nodes (depending what we consider as *binary seed* for *bootstrapping*)

## What does reproducing a computational environment mean?

Alice says "GCC at version 11.2.0"

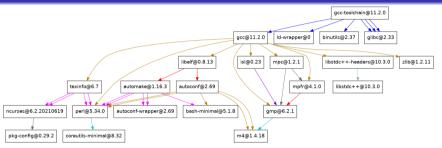
### All the tools (node of the graph) must be captured!

#### Remember

(due to constant folding)

# State = Directed Acyclic Graph(DAG)

### package manager = graph manager



The Guix's way

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## Each node specifies a recipe defining:

- code source
- build-time tools
- dependencies

- and potentially some ad-hoc modifications (patch)
- compilers, build automation, configuration flags etc.
  - other packages ( $\rightarrow$ recursive  $\rightsquigarrow$  graph)

Complete graph: Python = 137 nodes, Numpy = 189, Matplotlib = 915, Scipy = 1439 nodes

Situation

## Revision = one specific graph

« GCC at version 11.2.0 » = one pinned graph

```
guix describe
Generation 76 Apr 25 2022 12:44:37 (current)
 guix eb34ff1
   repository URL: https://git.savannah.gnu.org/git/guix.git
    branch: master
    commit: eb34ff16cc9038880e87e1a58a93331fca37ad92
```

this revision eb34ff1 captures the complete graph

- ► Alice says « I used Guix at revision eb34ff1 »
- ▶ Blake knows all for reproducing the same environment

Situation

Guix is helping

#### Alice

Situation

describes her environment:

▶ the list of the tools using the file manifest.scm, spawns her environment e.g., guix shell -m manifest.scm

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describes her environment:

- ▶ the list of the tools using the file manifest.scm. spawns her environment e.g.,
  - guix shell -m manifest.scm
- ▶ the revision (Guix itself and potentially all the other channels)
  - guix describe -f channels > state-alice.scm

Guix is helping

collaborate = share one computational environment

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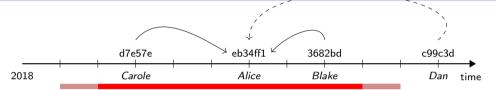
#### Blake

spawns the same computational environment from these two files

guix time-machine -C state-alice.scm -- shell -m manifest.scm

## Reproducible = jump to different states

guix time-machine



Requirements for being reproductible with the passing of time using Guix:

- ▶ Preservation of the all source code
- Backward compatibility of the Linux kernel
- Compatibility of hardware

(to some extent)

► ( No time-bomb! )

What is the size of this temporal window where these 3 conditions are satisfied?

To my knowledge, the Guix project is quasi-unique by experimenting since v1.0 in 2019.

Situation

## how to redeploy later and elsewhere what has been deployed today and here?

### Traceability and transparency

being collectively able to study bug-to-bug

Guix should manage everything

about the environment

```
guix time-machine -C state.scm -- shell -m list-software.scm
```

if it is specified

Situation

« how to build »

channels.scm

(state)

« what to build »

manifest.scm (software list)

## how to redeploy later and elsewhere what has been deployed today and here?

### Traceability and transparency

being collectively able to study bug-to-bug

Guix should manage everything

about the environment

```
guix time-machine -C state.scm -- shell -m list-software.scm
```

if it is specified

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auto-promo:

Toward practical transparent verifiable and long-term reproducible research using Guix (link)

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The Guix's way

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(state)

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What is required in addition to these 2 files?

(opinionated)

Still issues!

## Guix cannot fix all the broken world, isn't it?





Computational environment and source code archiving: difficulties and countermeasures

Situation 00000000 Still issues!

## Guix cannot fix all the broken world, isn't it?







▶ Which one is efficient?

Situation Still issues!

## Guix cannot fix all the broken world, isn't it?







▶ Which one is efficient? It depends on efficient... fast? torque? weight?

Situation 00000000 Still issues!

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- Which one is efficient? It depends on efficient...fast? torque? weight?
- ▶ Which one is robust?

Situation 0000000 Still issues!

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(opinionated)





- Which one is efficient? It depends on efficient...fast? torque? weight?
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Complicated Easv VS VS VS Simple Complex VS

Easy: near to our skill, familiar (≈relative)

Simple: one task, one concept ( $\approx$ predictable)

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- ▶ Which one is efficient? It depends on efficient...fast? torque? weight?
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Complicated Easv VS VS

Simple VS

Complex

Easy: near to our skill, familiar (≈relative)

Simple: one task, one concept ( $\approx$ predictable)

#### Rule of thumb

- Composing simple systems builds complex and robust systems
- Complex and easy systems are complicated thus fragile
- If you have no idea where to start for auditing a tool, it's suspicous!

# (Un)Reproducible research

(opinionated)

the main issue is more about our collective practises

Situation 0000000 Still issues!

# (Un)Reproducible research

(opinionated)

the main issue is more about our collective practises

than about technical limitations of our tools

Situation 00000000 Still issues!

# (Un)Reproducible research

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#### **Technical Roadblocks**

random pick of four among others

- How to audit pre-trained Machine Learning models?
- ② Hardware evolution over project duration (2-10 years)
- Omputational environment (deployment) bit-for-bit reproducible is reachable! Bit-for-bit reproducible computation is more difficult. Does it make sense?
- What is the size of the binary seed rooting the graph of dependencies? language: Haskell, OCaml, Rust, etc.

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#### Technical Roadblocks

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#### What the time will eat is unknown

consider efficient as robust (and frugal) then the rest, eventually

Food for thought

Situation

## ACM REP 24: Conference on Reproducibility and Replicability

► The Impact of Hardware Variability on Applications Packaged with Docker and Guix: a Case Study in Neuroimaging (link) we study the effect of nine different CPU models using two software packaging systems (Docker and Guix), and we compare the resulting hardware variability to numerical variability measured with random rounding.

The Guix's way

► Embracing Deep Variability For Reproducibility and Replicability (link) we delve into the application of software engineering techniques, specifically variability management, to systematically identify and explicit points of variability that may give rise to reproducibility issues (eg language, libraries, compiler, virtual machine, OS, environment variables, etc).

Situation

## Reproducible deployment

(ideally)

- ▶ Alice says the tool r-harmony from Guix revision eb34ff1 (revision from 2022).
- ▶ Blake runs on a different machine or at a different point in time:

```
guix time-machine --commit=eb34ff1 -- shell r-harmony
```

and Blake deploys the exact same software environment, bit-for-bit.

25 / 47

Preservation of what? and why?

Situation

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#### Under the assumptions

► All the source code is still publicly available.

(e.g., more than 477)

► All the intermediary builds are deterministic.

reproducible-builds.org (link)

Preservation of what? and why?

Situation

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is all the source code still publicly available?

Situation

## "Link rot" empirical evaluation = the problem

(completed mid-2024)

	Dec. 2022 v1.4.0
#sources	20 184
avail. missing hash mis.	96.4% 3.6% 52

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Situation

## "Link rot" empirical evaluation = the problem

(completed mid-2024)

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- openidk-9.181.tar.bz2 is unavailable
  - from its original upstream URL as it appears in Guix v1.4.0.
- openjdk@9.181 had 184 dependents

loosing it  $\implies$  loosing 185 packages, not one.

Situation

## "Link rot" empirical evaluation = the problem

(completed mid-2024)

	May 2021 v1.3.0	Dec. 2022 v1.4.0
#sources	15 520	20 184
avail.	95.7%	96.4%
missing hash mis.	4.3% 66	3.6% 52

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Situation

## "Link rot" empirical evaluation = the problem

(completed mid-2024)

	Nov. 2020	May 2021	Dec. 2022
	v1.2.0	v1.3.0	v1.4.0
#sources	13 609	15 520	20 184
avail.	95.0%	95.7%	96.4%
missing	5.0%	4.3%	3.6%
hash mis.	69	66	52

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(completed mid-2024)

	Apr. 2020	Nov. 2020	May 2021	Dec. 2022
	v1.1.0	v1.2.0	v1.3.0	v1.4.0
#sources	11 659	13 609	15 520	20 184
avail.	92.4%	95.0%	95.7%	96.4%
missing	7.6%	5.0%	4.3%	3.6%
hash mis.	63	69	66	52

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	v1.0.0	v1.1.0	v1.2.0	v1.3.0	v1.4.0
#sources	8 794	11 659	13 609	15 520	20 184
avail.	91.5%	92.4%	95.0%	95.7%	96.4%
missing	8.5%	7.6%	5.0%	4.3%	3.6%
hash mis.	87	63	69	66	52

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Situation

# Software Heritage comes in!

## Like all digital information, source code is fragile

link rot: projects are created, moved around, removed

"too big to fail": e.g., Gitorious.org, Google Code, Bitbucket, etc.

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If a website disappears, you go to the Internet Archive. . .

Where do you do if (a repository on) GitHub or GitLab goes away?

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Answer: Software Heritage

Situation

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"too big to fail": e.g., Gitorious.org, Google Code, Bitbucket, etc.



#### collect, preserve and share source code

If a website disappears, you go to the Internet Archive. . .

Where do you do if (a repository on) GitHub or GitLab goes away?

Answer: **Software Heritage** 

The SWH archive is the largest publicly available archive of software source code.

Situation

## Software Heritage: international + non-profit

built with long term in mind





widely supported

SWH, pillar of Open Science, pillar of Reproducible Research!

# Software Heritage in a nutshell: SWH

www.softwareheritage.org



Collect, preserve and share all software source code

Preserving our heritage, enabling better software and better scientific outcome for all

SWH, pillar of Open Science, pillar of Reproducible Research!

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# Reference catalog Solding Community Grand Catalog find and reference all software source code

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#### Collect, preserve and share all software source code

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find and reference all software source code

#### Universal archive



preserve and share all software source code SWH, pillar of Open Science, pillar of Reproducible Research!

# Software Heritage in a nutshell: SWH





#### Collect, preserve and share all software source code

Preserving our heritage, enabling better software and better scientific outcome for all

#### Reference catalog



find and reference all software source code

#### Universal archive



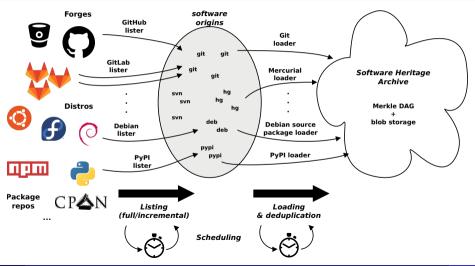
preserve and share all software source code

#### Research infrastructure



enable analysis of all software source code Ingest well-known public source code warehouses

## Data flow: Harvest as much as publicly available!



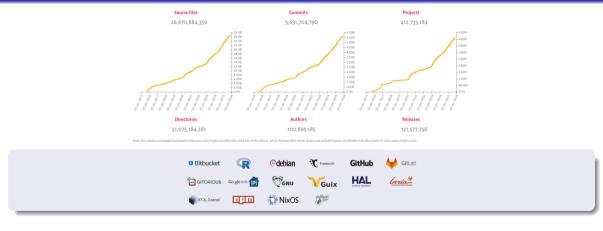
The Guix's way

Software Heritage

Ingest well-known public source code warehouses

# SWH archive coverage

# archive.softwareheritage.org



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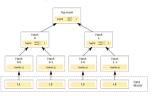


- on disk: ~1 PiB; as a graph ~35 B nodes, ~500 B edges
- ▶ the largest public source code archive in the world (and growing!)

Situation 000000000

# SWH archive: a (giant) Merkle DAG

Merkle tree (R. C. Merkle, CRYPTO 1987)



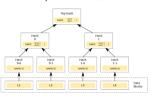
#### Combination of tree and hash function

Classical cryptographic construction

- ► fast, parallel signature of large data structures
- ▶ widely used (e.g., Git, blockchains, IPFS, ...)
- built-in deduplication

# SWH archive: a (giant) Merkle DAG

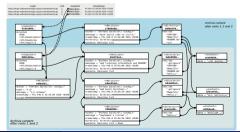
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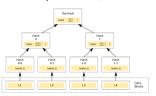
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- A global graph linking together
- ► fully deduplicated source code artifact (files, commits, directories, releases, etc.)
- providing a unified view on the entire Software Commons.

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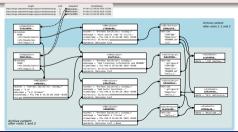


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#### find and reference: SWHID



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- fully deduplicated source code artifact (files, commits, directories, releases, etc.)
- providing a unified view on the entire Software Commons.

swhid.org

Content-addressed reference, intrinsic identifier, inherent identifier

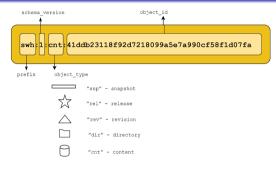
# Software Heritage Identifiers (SWHIDs)



swhid.org

Content-addressed reference, intrinsic identifier, inherent identifier

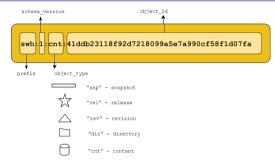
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swhid.org

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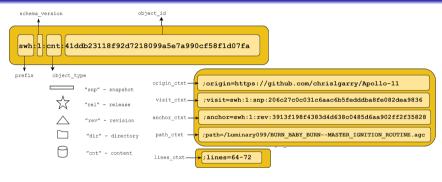
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https://archive.softwareheritage.org/swh:1:cnt:41ddb23118f92d7218099a5e7a990cf58f1d07fa

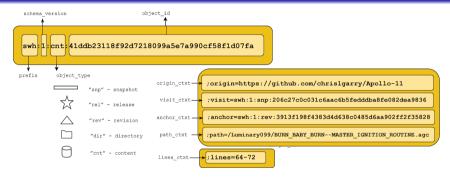
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## Software Heritage Identifiers (SWHIDs)



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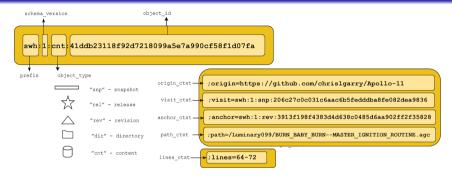
## Software Heritage Identifiers (SWHIDs)



demo! (link)

Content-addressed reference, intrinsic identifier, inherent identifier

## Software Heritage Identifiers (SWHIDs)



demo! (link)

an emerging standard

HOWTO archive and reference your code (link)

Content-addressed reference, intrinsic identifier, inherent identifier

## Software Heritage Identifiers (SWHIDs)



demo! (link)

demo save! (link)

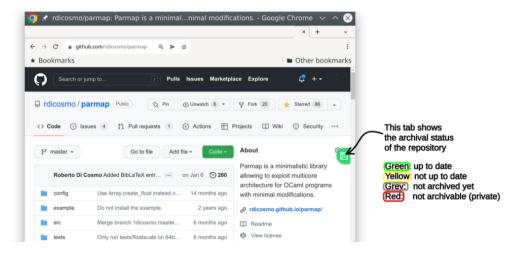
an emerging standard

HOWTO archive and reference your code (link)

#### Browser extension

Situation

## https://www.softwareheritage.org/browser-extensions



## Deposit source code via HAL

#### https://doc.hal.science/deposer/deposer-le-code-source



#### Guide utilisateur

#### Déposer le code source d'un logiciel

Quel logiciel déposer dans HAL/Software Heritage ?

Qu'appelle-t-on un logiciel de recherche? Quels types de logiciels sont éligibles?

Quels fichiers déposet-on?

2 modalités de dépôt selon les modalités de développement

Option 1 : Le logiciel a été développé en dehors d'une plateforme de développement en ligne, en local

#### Utiliser l'identifiant pérenne SoftWare Hash | Dentifier (SWHID) <

Pour reproduire une expérience, il est indispensable de connaître avec exactitude la version du logiciel, ce que permet le SoftWare Hash IDentifier (SWHID). Avec le SWHID vous pouvez retrouver dans l'archive de Software Heritage vos codes, lire en ligne tous les contenus textuels et télécharger le code source.

Grâce au SWHID, l'identification des logiciels s'effectue sans passer par un registre. en effet, le SWHID est calculé à partir des données du code source lui-même, à la différence d'un identifiant de type DOI qui s'appuie sur un registre externe pour faire le lien entre un objet et sa description. Le SWHID est l'empreinte digitale du logiciel et ne dépend pas d'un résolveur: un utilisateur peut ainsi le calculer localement.

Chaque version du schéma d'identification est entretenue même quand celui-ci sera étiqueté obsolète, dans le cas de collisions sur les hachages SHA1.

Bon à savoir : si pour le dépôt dans HAL, le SWHID de type "directory" est requis, une fois que le code source est archivé dans Software Heritage, il est possible d'obtenir des SWHID pour différents artefacts : un fichier, un commit, quelques lignes de code source dans un fichier donné, etc. Le pré-requis est d'accepter le transfert vers Software Heritage si le dépôt a été effectué selon les modalités de l'option 1.

En savoir plus sur le SWHID

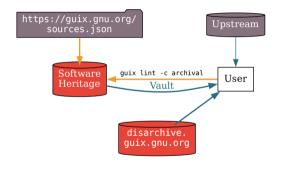
https://www.softwareheritage.org/2020/05/26/citing-software-with-style



How to rescue source code?

Situation

## $Guix + SWH = \emptyset$



#### content-address

Guix: "normalized archive"

nar + sha256

SWH: SWHID

Git compatible sha1

Guix the first free software distribution and tool backed by the stable SWH archive

Situation

## ACM REP 24: Conference on Reproducibility and Replicability

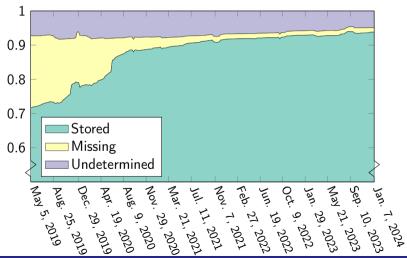
- ▶ Source Code Archiving to the Rescue of Reproducible Deployment (link)

  We describe our work connecting Guix with Software Heritage, the universal source code archive, making Guix the first free software distribution and tool backed by a stable archive.
- ▶ Longevity of Artifacts in Leading Parallel and
  Distributed Systems Conferences: a Review of the State of the Practice in 2023 (link)

  By reviewing the methods and tools used to create and share artifacts in a technical, indepth, and article content-agnostic manner, we found that the state of practice does not address reproducibility in terms of artifact longevity and we expose eight observations that support this finding.

How to rescue source code?

## Coverage by sampled Guix revision



Situation 0000000 The end?

## Concretely, does it work for real?

guix time-machine --commit=6298c3ffd96 -- install r-harmony

Installs (and potentially rebuilds) Harmony defined in Guix 1.0.0 from 2019.

Situation 0000000 The end?

## Concretely, does it work for real?

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- ▶ This command exploits SWH support as it was in 2019: in its infancy.
- Recovery mechanism is itself improving over time.

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#### Rebuilding the whole only from SWH

- ▶ June 2023 redoing paper from 2020 (link)
- ► December 2023 redoing paper from 2022 (link)

Situation The end?

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### Rebuilding the whole only from SWH

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- ► December 2023 redoing paper from 2022 (link)

#### Two main difficulties remain:

- Bootstrapping binary seed rooting the graph of dependencies storing the seed itself and rebuilding from the seed, if needed
- Time bomb deterministic build depends on date

we can fix the future not the past

Adventures on the quest for long-term reproducible deployment (link)

So, convinced?

"few" and "basic" needs for software

reminder, 4 letters: ARDC

#### Archive

Research software artifacts must be properly archived

make sure we can retrieve them (reproducibility)

#### Reference

Research software artifacts must be properly referenced

make sure we can identify them (reproducibility)

#### Describe

Research software artifacts must be properly described

make it easy to  ${\it discover}$  and  ${\it reuse}$  them ( ${\it visibility})$ 

#### Cite/Credit

Research software artifacts must be properly cited (not the same as referenced!)

to give credit to authors (evaluation!)

## Reproducible computational environment, when?

(opinionated)

when collective practises will stop to promote engineering methods

engineering method science method what do we gain compared to current? vs what do we understand compared to current?

efficient vs robust

user autonomy<sup>1</sup>

Thanks Guix and Software Heritage, the situation is improving over the years

<sup>&</sup>lt;sup>1</sup>digital sovereignty

#### Beloved Ancient Greeks





Mnemosyne pearls memory

Cronus scythe time

We cannot predict beforehand what the scythe will cut

#### **Pearls**

- simple made easy
- efficient means robust
- content-addressed, intrinsic identifier, inherent reference
- transparent and auditable computational environment
- focus on user-autonomy

Are Guix and Software Heritage two pearls against the scythe?

Let make better scientific outcomes!

it depends on our collective practices

#### use, adopt, advocate





https://hpc.guix.info

https://softwareheritage.org

contribute, fund, support, join

Join the fun!

#### The vision to reach



# Software Heritage



## Questions?



https://www.softwareheritage.org



https://hpc.guix.info/events/2024-2025/café-guix



https://www.recherche-reproductible.fr



## Some papers

enable research

- Source Code Archiving to the Rescue of Reproducible Deployment Ludovic Courtès, Timothy Sample, Simon Tournier, Stefano Zacchiroli ACM REP '24: Proceedings of the 2nd ACM Conference on Reproducibility and Replicability.
- A Large-scale Dataset of (Open Source) License Text Variants
   Stefano Zacchiroli
   MSR 2022 (best dataset paper) + Empir. Soft. Eng. 28(6): 147 (2023)
- Geographic diversity in public code contributions
   Davide Rossi, Stefano Zacchiroli
   MSR 2022
- Gender differences in public code contributions: a 50-year perspective Stefano Zacchiroli
   IEEE Software. 2021

## Why preserving?

#### Because online services sometimes stop

- ► Google Code (link) early 2016
- ► Alioth (Debian) in 2018 replaced by Salsa
- ► Gna! in 2017 after 13 years
- ▶ Gitourious in 2015 (the second most popular service for hosting Git repository in 2011)
- ▶ etc.

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- etc.
- ▶ gforge.inria.fr for example Guix issue #42162 (link)

Believe it or not, gforge.inria.fr was finally phased out on Sept. 30th. And believe it or not, despite all the work and all the chat :-), we lost the source tarball of Scotch 6.1.1 for a short period of time (I found a copy and uploaded it to berlin a couple of hours ago).

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## How to preserve?

#### Forge $\neq$ Archive

collaborative software platform for developing

L'objectif d'une forge est de permettre à plusieurs développeurs de participer ensemble au développement d'un ou plusieurs logiciels, le plus souvent à travers le réseau Internet.

https://fr.wikipedia.org/wiki/Forge\_(informatique)

(no English wikipedia entry)

L'archivage est un ensemble d'actions qui a pour but de garantir l'accessibilité sur le long terme d'informations (dossiers, documents, données) que l'on doit ou souhaite conserver pour des raisons juridiques

https://fr.wikipedia.org/wiki/Archivage

Software Heritage « are building the universal software archive » (link)

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## Recipe for defining a package

one node of the graph

```
(define python
                                 ; definition of the node python
  (package
    (name "python")
    (version "3.9.9")
    (source ...)
                                     ; points to URI source code
    (build-system gnu-build-system)
                                    ;./configure & make
                                     ; configure flags, etc.
    (arguments ...)
    (inputs (list bzip2
                                     ;other nodes -> graph (DAG)
                  expat gdbm libffi sqlite ...)))
```

Each inputs is similarly defined

 $(\mathsf{recursion} o \mathsf{graph})$ 

► There is no cycle

(bzip2 or its inputs cannot refer to python)

What are the roots of the graph? Part of the broad bootstrapping (link) problem

```
(define-public python-scikit-learn
  (package
    (name "python-scikit-learn")
    (version "1.4.2")
    (source
     (origin
       (method git-fetch)
       (uri (git-reference
             (url "https://github.com/scikit-learn/scikit-learn"
             (commit version))
       (sha256
        (base32
         "Opdd508c9540x9qimq83b8kspb6mb98w7w7i7lnb1jqj7rijal6f")
    :: various fields omitted
```



```
origin specifies:
```

method: tarball, VCS as Git, Mercurial, Subversion, etc.

uri: upstream location (URL)

sha256: cryptographic hash



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guix download finds the source with the expected hash and proceeds.

a content-addressed server

as served by the Guix project or the Nix project, or the Software Heritage initiative.

#### Fallback in action

```
$ guix time-machine -C channels.scm -- shell -m manifest.scm
Updating channel 'guix' from Git repository at 'https://git.savannah.gnu.org/gi
Updating channel 'example' from Git repository at 'https://whatever-here.org/do
SWH: found revision 67c9f2143aa6f545419ae913b4ae02af4cd3effc with directory at
SWH vault: requested bundle cooking, waiting for completion...
swh:1:rev:67c9f2143aa6f545419ae913b4ae02af4cd3effc.git/
Γ...
fatal: could not read Username for 'https://github.com': No such device or addr
Trying content-addressed mirror at berlin.guix.gnu.org...
Trying to download from Software Heritage...
SWH: found revision eleefd033b8a2c4c81babc6fde08ebb116c6abb8 with directory at
[\ldots]
```

https://simon.tournier.info/posts/2021-10-25-software-heritage.html

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Images from Gmsh and GetDP projects, slide: 1.

Images from Wikipedia, slide: 1.

Courtesy of Software Heritage team, slides: 8, 10, 29, 30, 32, 33, 34, 35, 41.